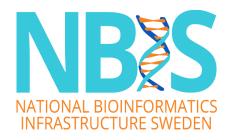
### **Bioinformatics for Pls:**

### **Bioinformatics Workflows**

Agata Smialowska

NBIS Stockholm, 17 September 2019

agata.smialowska@nbis.se



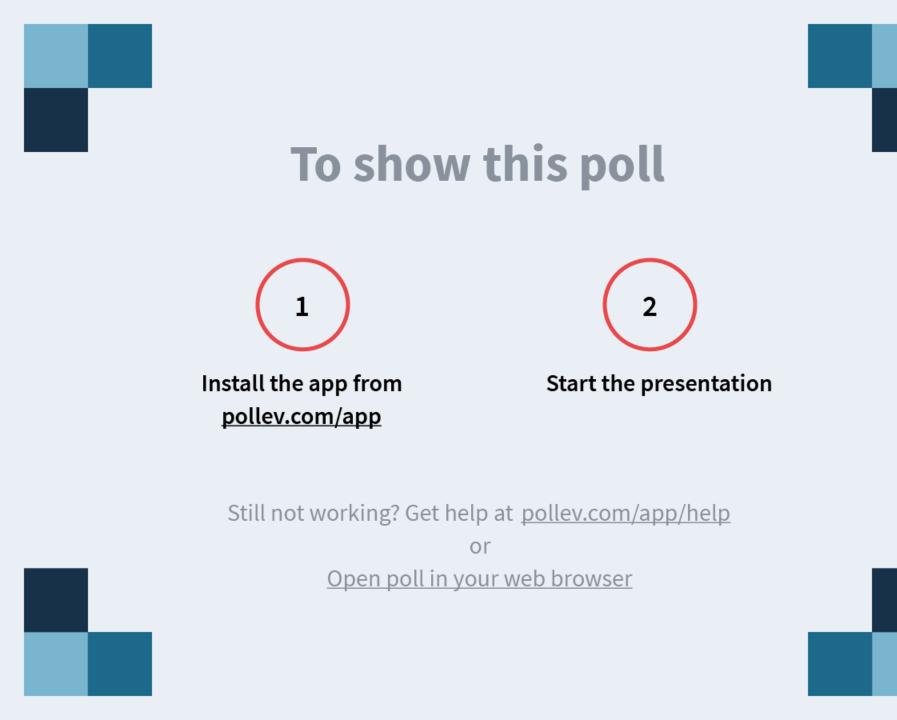




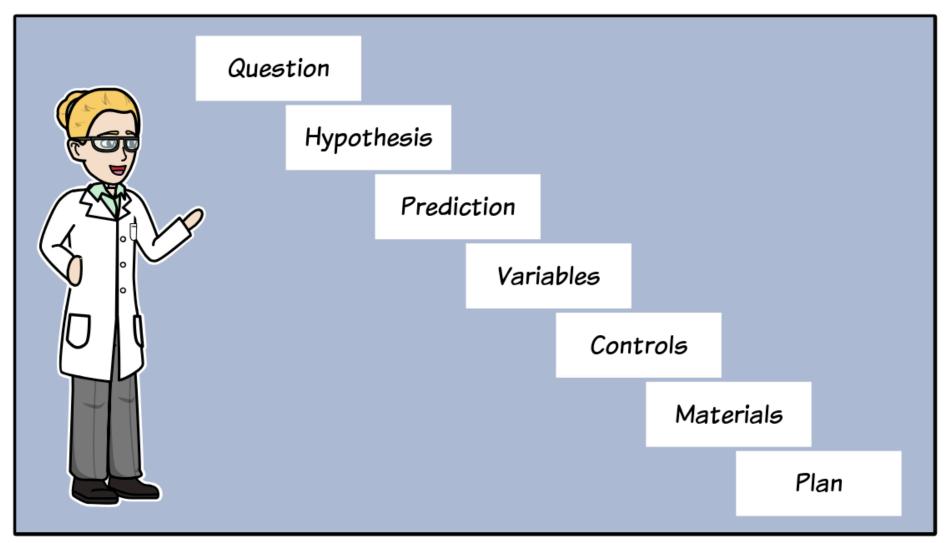
### In the internet browser:

https://pollev.com

agatas031 (not case-sensitive)

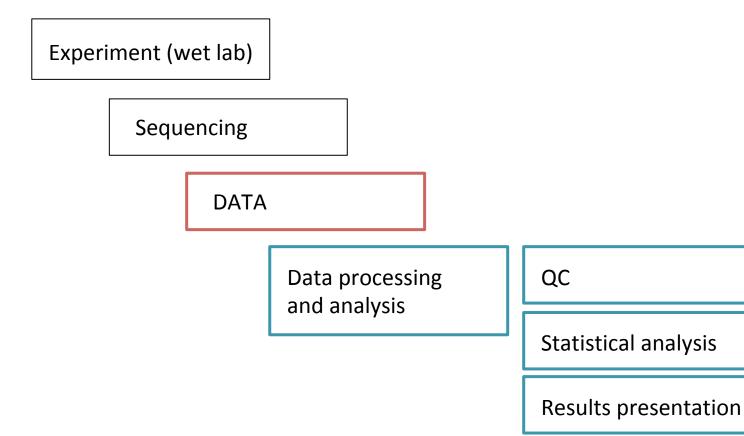


#### Life cycle of a scientific project – part 1



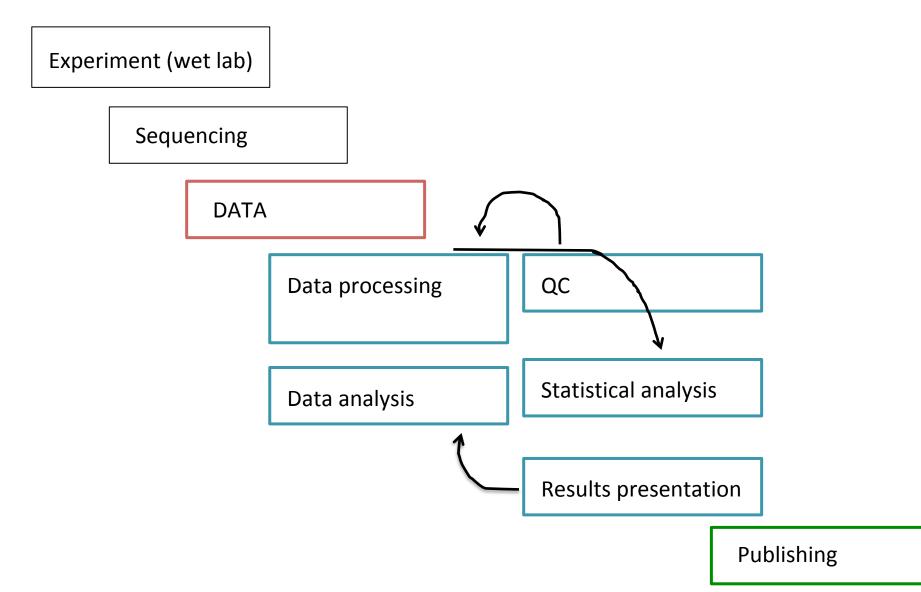
Create your own at Storyboard That

#### Life cycle of a scientific project – part 2

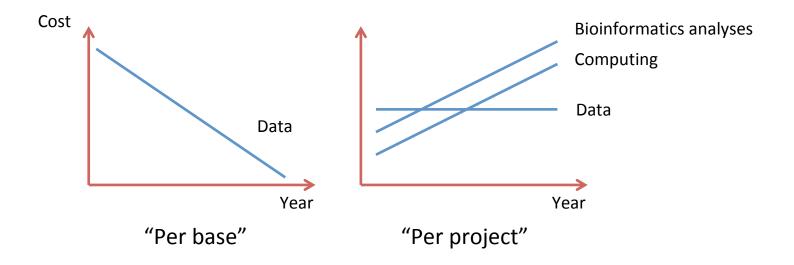


Publishing

#### Life cycle of a scientific project – part 2



#### Production is cheap, analysis is not



#### Concepts for data-driven research

- reproducible research
- FAIR data
- Integrative omics

#### Experimental design



A simple truth: There is no technology nor statistical wizardry that can save a poorly planned experiment. <u>The</u> <u>only truly failed experiment is a poorly planned</u> <u>one.</u>

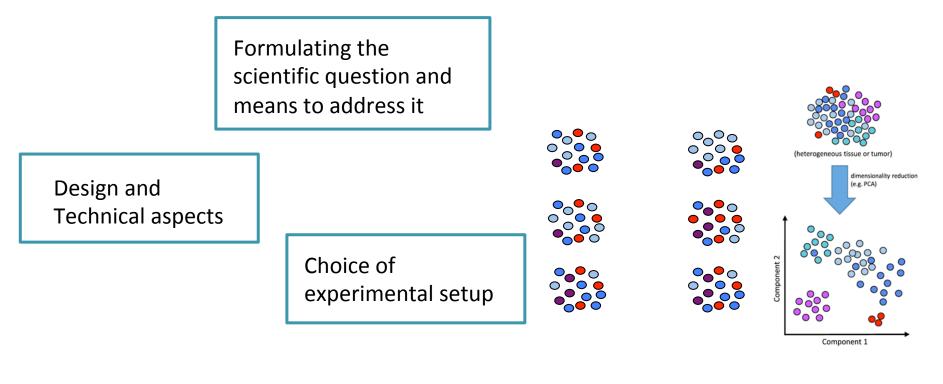
To consult the statistician after an experiment is finished is often merely to ask them to conduct a post mortem examination. They can perhaps say what the experiment died of. (Ronald Fisher, 1938)

### Experimental design

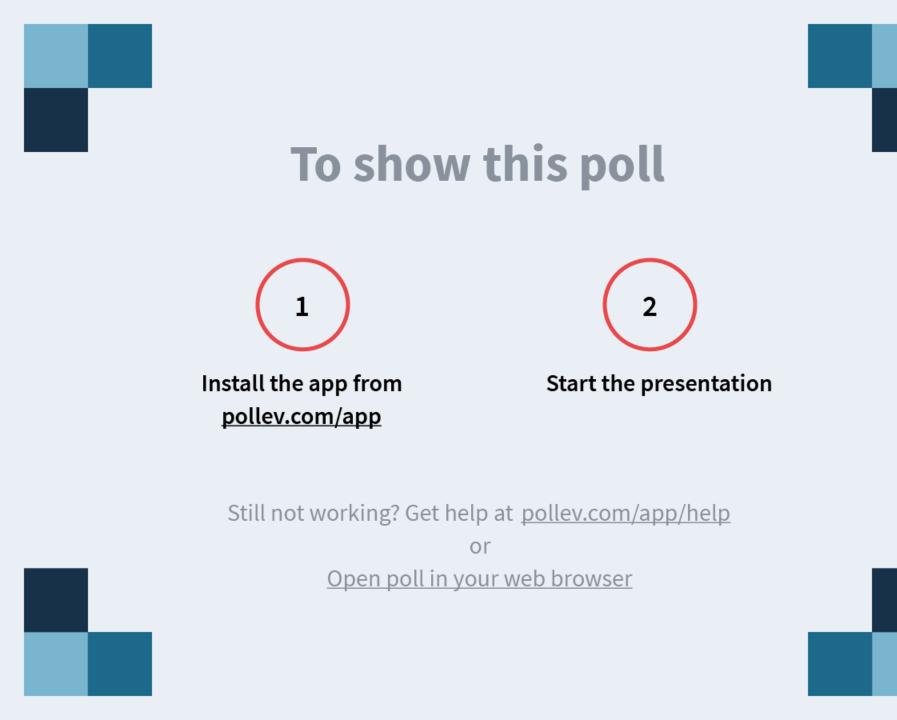
- Sound experimental design: replication, randomisation and blocking (R. Fisher, 1935)
- In the absence of a proper design, it is essentially impossible to partition biological variation from technical variation
- <u>To think about:</u>
  - Batches: Design your experiment to avoid *confounding* your different treatments (sex, nutrition) with each other or with technical variables (lane within a flow cell, between flow cell variation)
  - Statistical power to detect differences of interest (effect size, number of biological replicates)

#### Experimental design

We encourage you to discuss the experimental design with the person who will analyse the data (or with NBIS)!



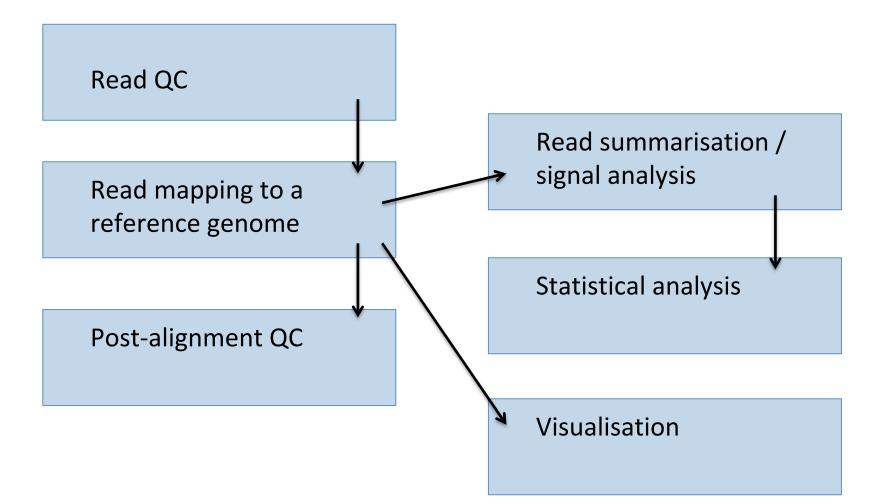
Low-input bulk RNA-seq Single cell RNA-seq



- 1. Introduction to workflows frequently used in bioinformatics of NGS data
- 2. Workflows for transcriptomics
  - 1. Bulk RNA-seq
  - 2. Small RNA-seq
  - 3. Variant discovery in RNA-seq data
- 3. Workflows for functional genomics
  - 1. ChIP-seq (TF)
- 4. Comments

- 1. Introduction to workflows frequently used in bioinformatics of NGS data
- 2. Workflows for transcriptomics
  - 1. Bulk RNA-seq
  - 2. Small RNA-seq
  - 3. Variant discovery in RNA-seq data
- 3. Workflows for functional genomics
  - 1. ChIP-seq (TF)
- 4. Comments

- Which reference genome? (newest assembly usually best) From which source (Ensembl, UCSC)
- Which read mapping strategy (global, local, alignment reporting, multimapping reads, which SAM tags to include, etc)? Which mapper?
- Post-alignment processing? Strategy?
- Read summarisation strategy? (reads with unique best alignments vs. all mapped reads, count all occurrences or in fractions?)



- Which reference genome? (newest assembly usually best) From which source (Ensembl, UCSC)
- Which read mapping strategy (global, local, alignment reporting, multimapping reads, which SAM tags to include, etc)? Which mapper?
- Post-alignment processing? Strategy?
- Read summarisation strategy? (reads with unique best alignments vs. all mapped reads, count all occurrences or in fractions?)

• It may be tempting to use an available solution (there are many pipelines out there)...

• It may be tempting to use an available solution (there are many pipelines out there)...

• No "One size fits all" solutions available

• It may be tempting to use an available solution (there are many pipelines out there)...

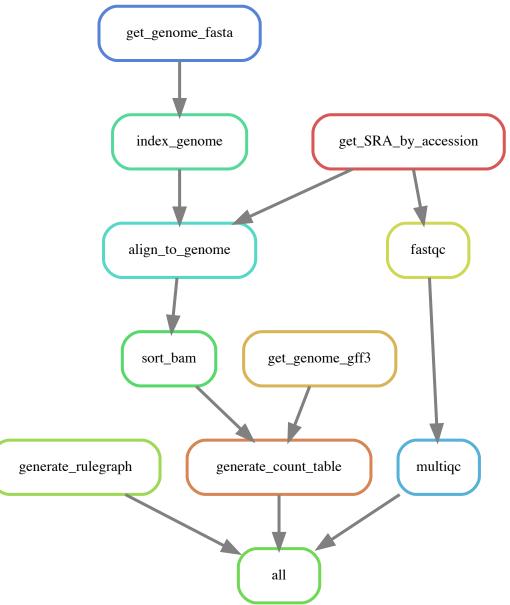
- No "One size fits all" solutions available
- **Best Practice** solutions (for standard cases):
  - **<u>ENCODE</u>** for functional genomics
  - **<u>GATK</u>** for variant analysis
  - Many resources for RNA-seq: Bioconductor, review publications, NBIS
    (!) depends on the actual question behind the experiment
  - NGI maintains pipelines for most of standard applications

1. Introduction to workflows frequently used in bioinformatics of NGS data

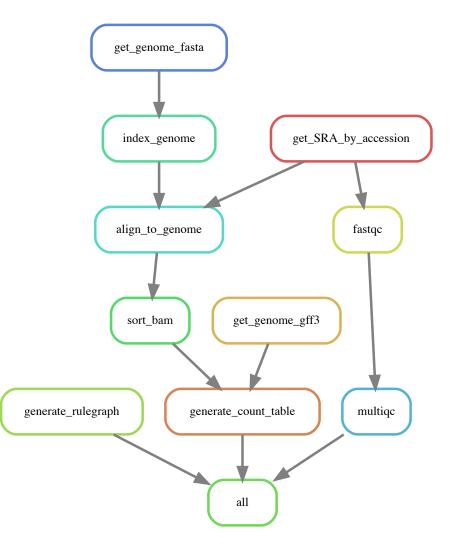
#### 2. Workflows for transcriptomics

- 1. Bulk RNA-seq
- 2. Small RNA-seq
- 3. Variant discovery in RNA-seq data
- 3. Workflows for functional genomics
  - 1. ChIP-seq (TF)
- 4. Comments

#### Bulk RNA-seq (differential expression)

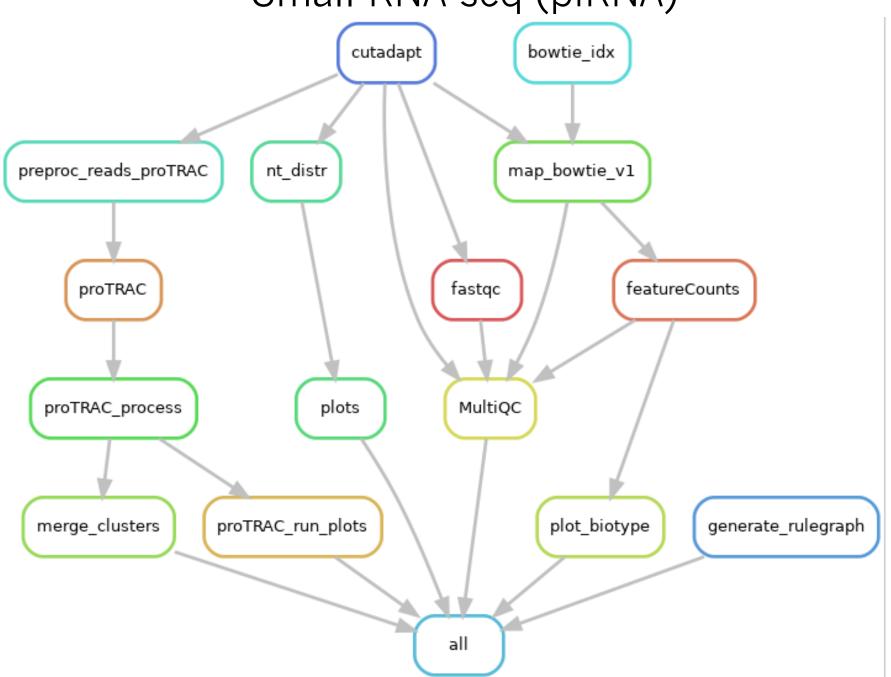


#### Bulk RNA-seq (differential expression)

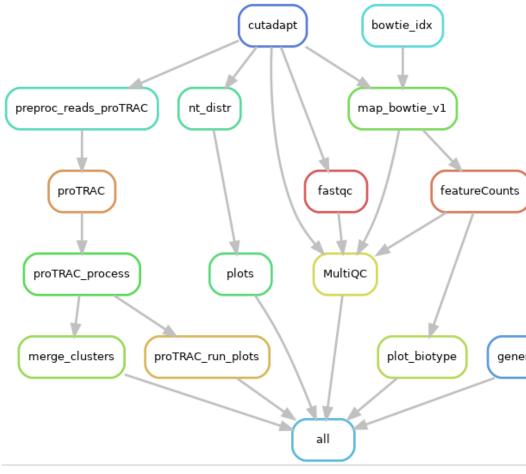


- Generation of reference genome index
- Get fastq files from SRA
- Read QC
- Mapping to reference genome
- Read counting
- Aggregation of QC metrics and program logs

#### Small RNA-seq (piRNA)

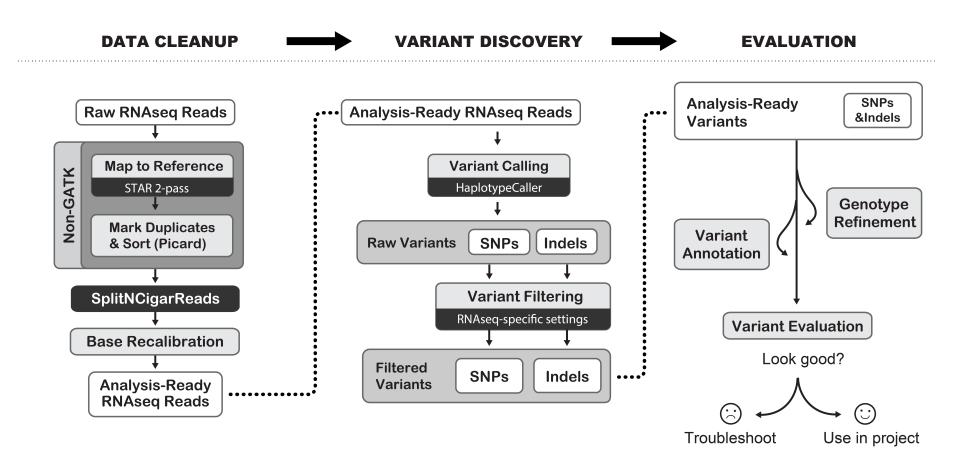


#### Small RNA-seq (piRNA)

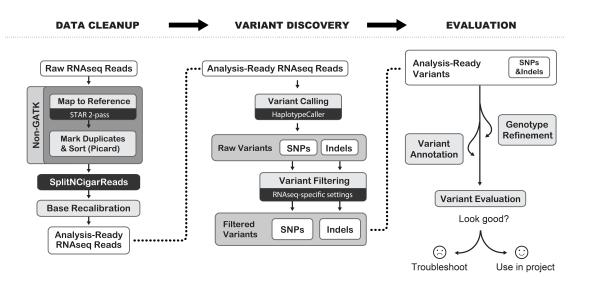


- Generation of reference genome index
- Raw read processing
- Raw read QC
- Mapping to reference genome
- Read counting
- Additional read processing for piRNA discovery
- Post-alignment QC metrics
- piRNA cluster discovery
- generate rule Processing of piRNA clusters
  - Generation of QC plots
  - Aggregation of QC metrics and program logs

#### Variant discovery in RNA-seq data (GATK)



#### Variant discovery in RNA-seq data (GATK)



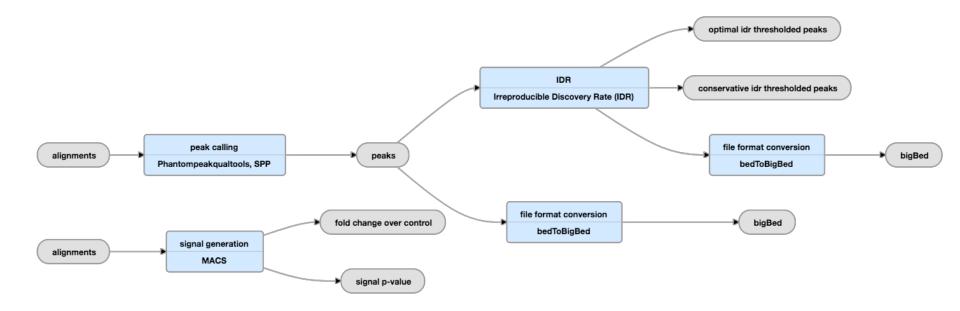
- Mapping to reference genome using a 2-pass protocol to gain accuracy on splice junctions
- Alignment processing: marking duplicates, refinement of raw alignments close to splice sites and base recalibration
- Variant calling
- Variant filtration
- Variant annotation

- 1. Introduction to workflows frequently used in bioinformatics of NGS data
- 2. Workflows for transcriptomics
  - 1. Bulk RNA-seq
  - 2. Small RNA-seq
  - 3. Variant discovery in RNA-seq data

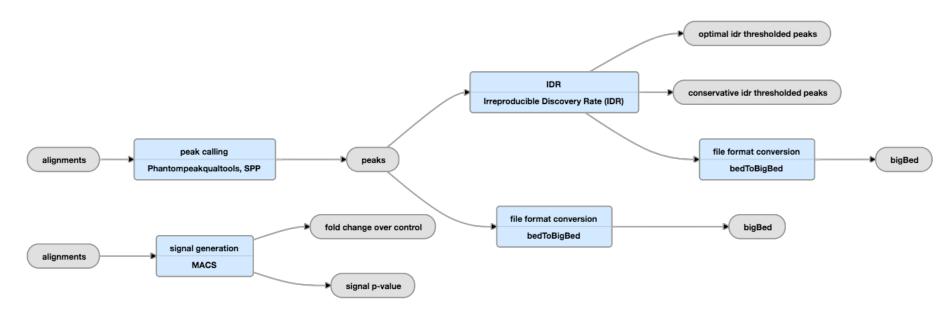
#### 3. Workflows for functional genomics

- 1. ChIP-seq
- 4. Comments

#### Workflow for ChIP-seq data processing



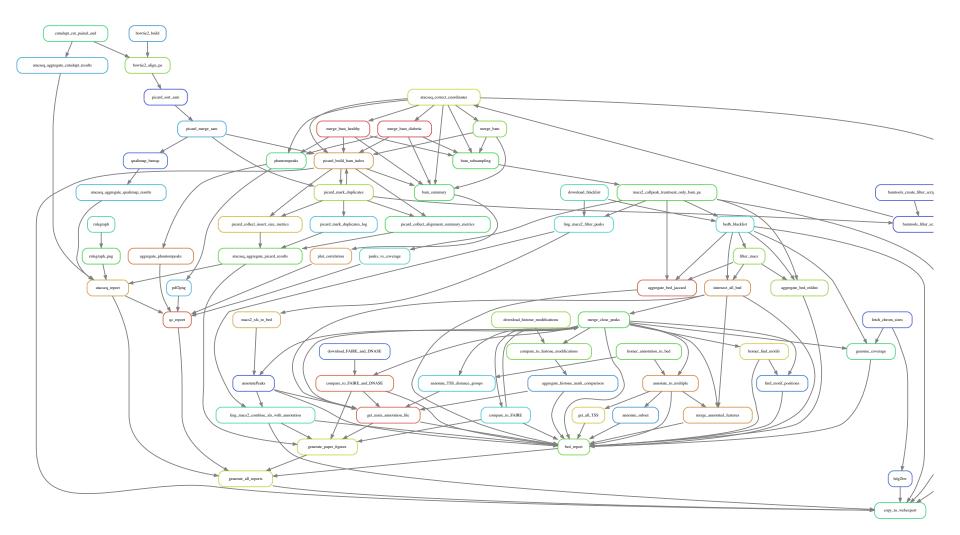
#### Workflow for ChIP-seq data processing



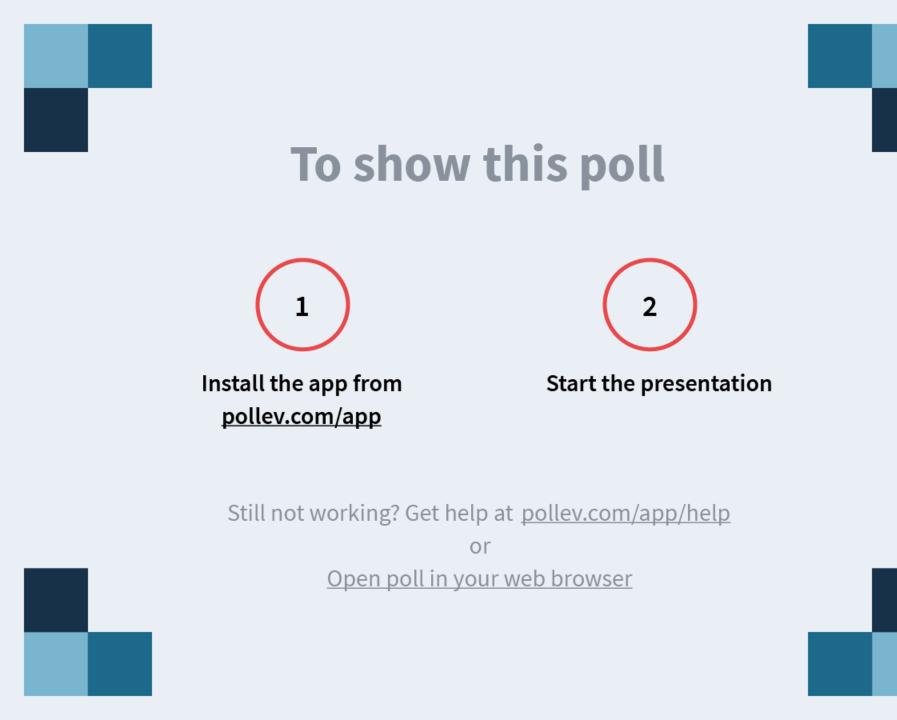
Starting point is processed alignments (already performed: marking duplicates, filtering out reads mapped to blacklisted regions, retaining only reads with one best alignment; QC; fragment length estimation)

- Peak detection
- Peak filtering
- IDR calculation
- Generation of coverage tracks

#### Workflow for ChIP-seq data processing

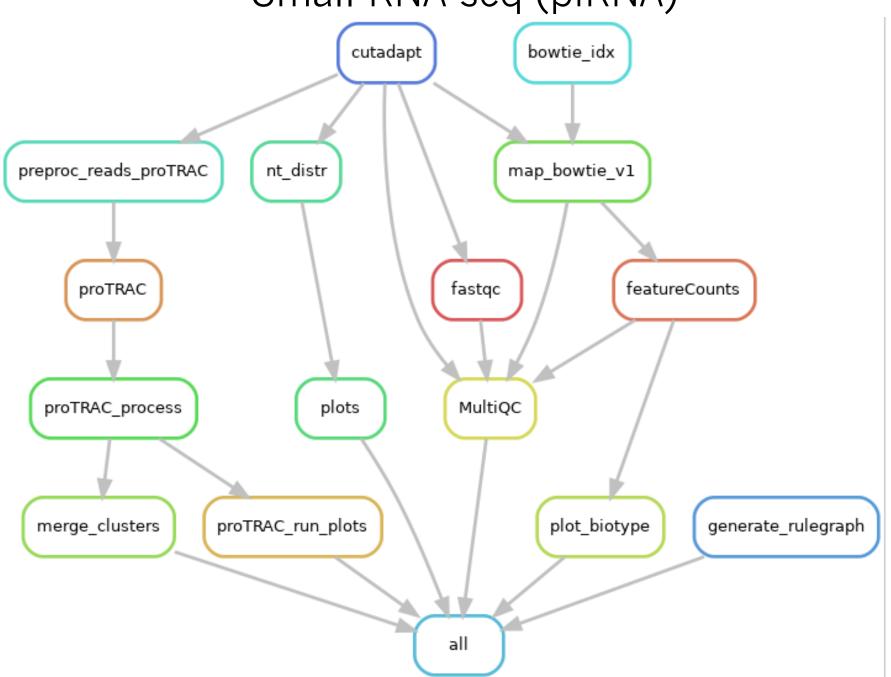


A close – to – truth example of a bioinformatics workflow



- 1. Introduction to workflows frequently used in bioinformatics of NGS data
- 2. Workflows for transcriptomics
  - 1. Bulk RNA-seq
  - 2. Small RNA-seq
  - 3. Variant discovery in RNA-seq data
- 3. Workflows for functional genomics
  - 1. ChIP-seq
- 4. Comments

#### Small RNA-seq (piRNA)



### piRNA pipeline when fate of each sample is depicted



9 samples

#### Workflow manager

- Workflow manager is tool for creating reproducible and scalable data analyses workflows that consist of a series of processing stages - known as 'pipelines'.
  - Snakemake
  - NextFlow
  - BPipe
- Advantages: automatic execution of the steps, handling failed jobs, easy restarting, easy parallelisation, compartmentalisation, integration with cluster resource managers, automatic logs, ...
- Cons: one has to learn a new tool to run the actual tools.

#### So if not "One-size-fits-all", what to do?

- Select only open source solutions and verify whether the workflow suits the needs of your project (tools, versions, reference, parameters).
- Check for updates is the workflow maintained? Does it support / implement the newest versions of common tools (i.e. read aligners, peak calling tools, QC tools, etc.)? Is the documentation understandable?
- How many other people use it? Is is a one-project workflow that also has an accompanying separate publication or is it generally accepted in the community?
- Contact an expert to discuss your choice (collaborator, colleague, NBIS consultation).

### Thank you

for your attention

#### Hands-on exercise

- Basic Unix commands to navigate server environments and transfer data
- Clone and use a git repository
- RNA-seq data processing workflow
  - QC of raw reads
  - Alignment format conversions
  - QC of mapped reads
  - Generating QC reports
  - Data inspection in a genome browser